

Intro to Recommender Systems

What are recommender systems?

Recommender systems capture the pattern of peoples' behavior and use it **to predict what else they might want or like.**



Applications

- What to buy?
 - E-commerce, books, movies, beer, shoes
- Where to eat?
- Which job to apply to?
- Who you should be friends with?
 - LinkedIn, Facebook, ...
- Personalize your experience on the web
 - News platforms, news personalization



Advantages of recommender systems

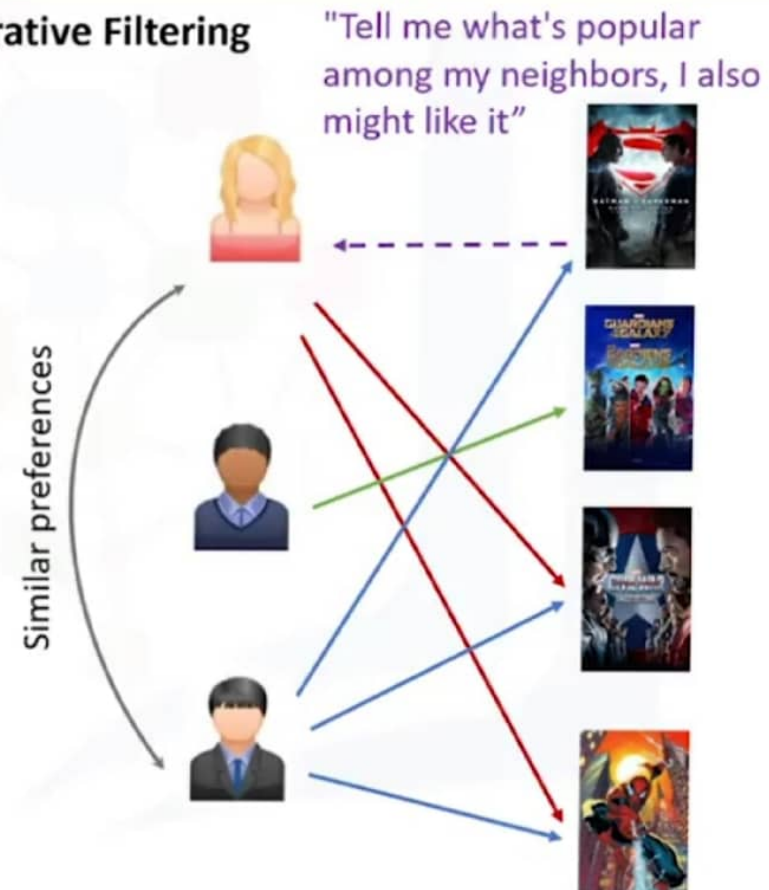
- Broader exposure
- Possibility of continual usage or purchase of products
- Provides better experience

Two types of recommender systems

Content-Based



Collaborative Filtering



Implementing recommender systems

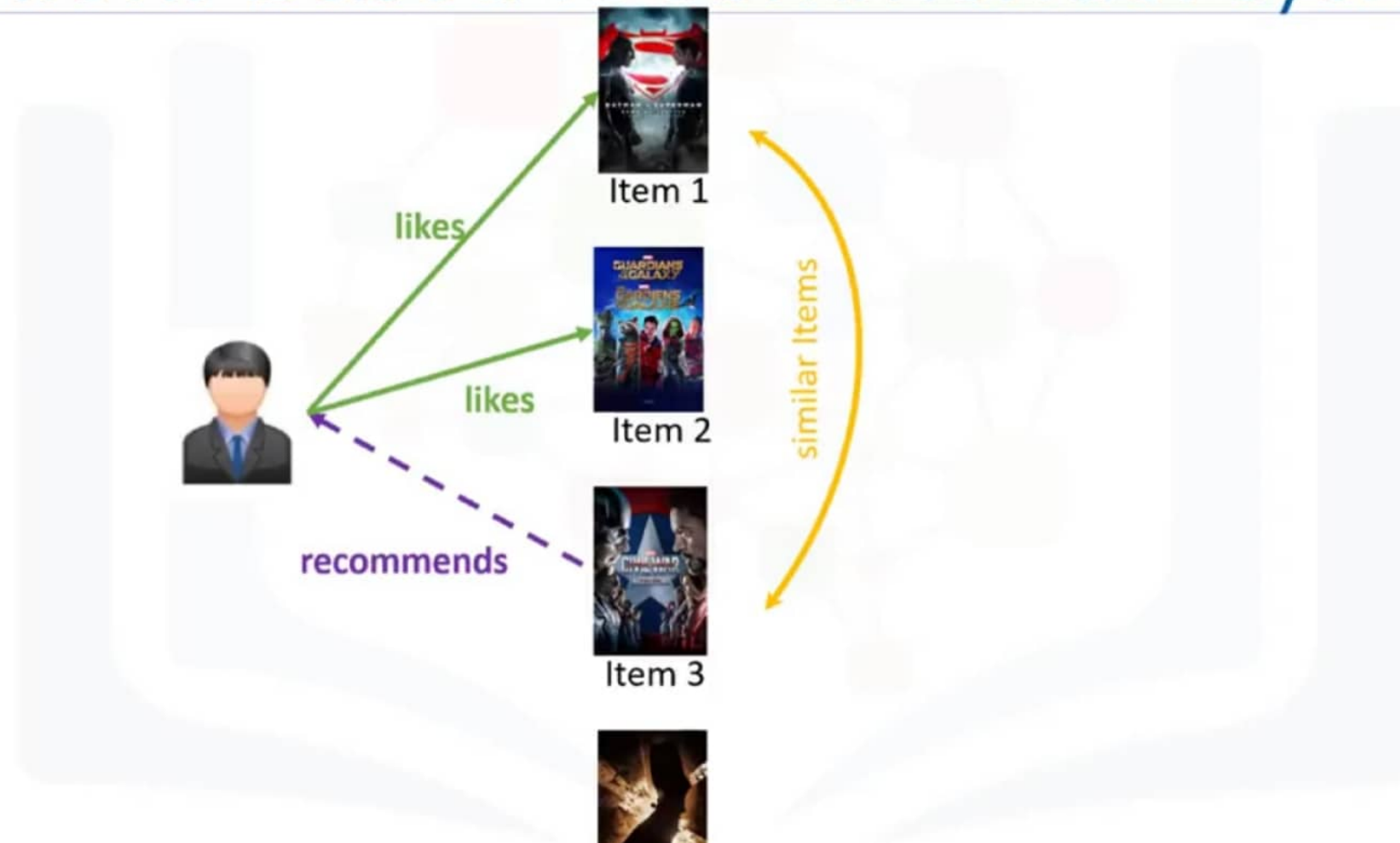
- Memory-based
 - Uses the entire user-item dataset to generate a recommendation
 - Uses statistical techniques to approximate users or items
e.g., Pearson Correlation, Cosine Similarity, Euclidean Distance, etc.
- Model-based
 - Develops a model of users in an attempt to learn their preferences
 - Models can be created using Machine Learning techniques like regression, clustering, classification, etc.



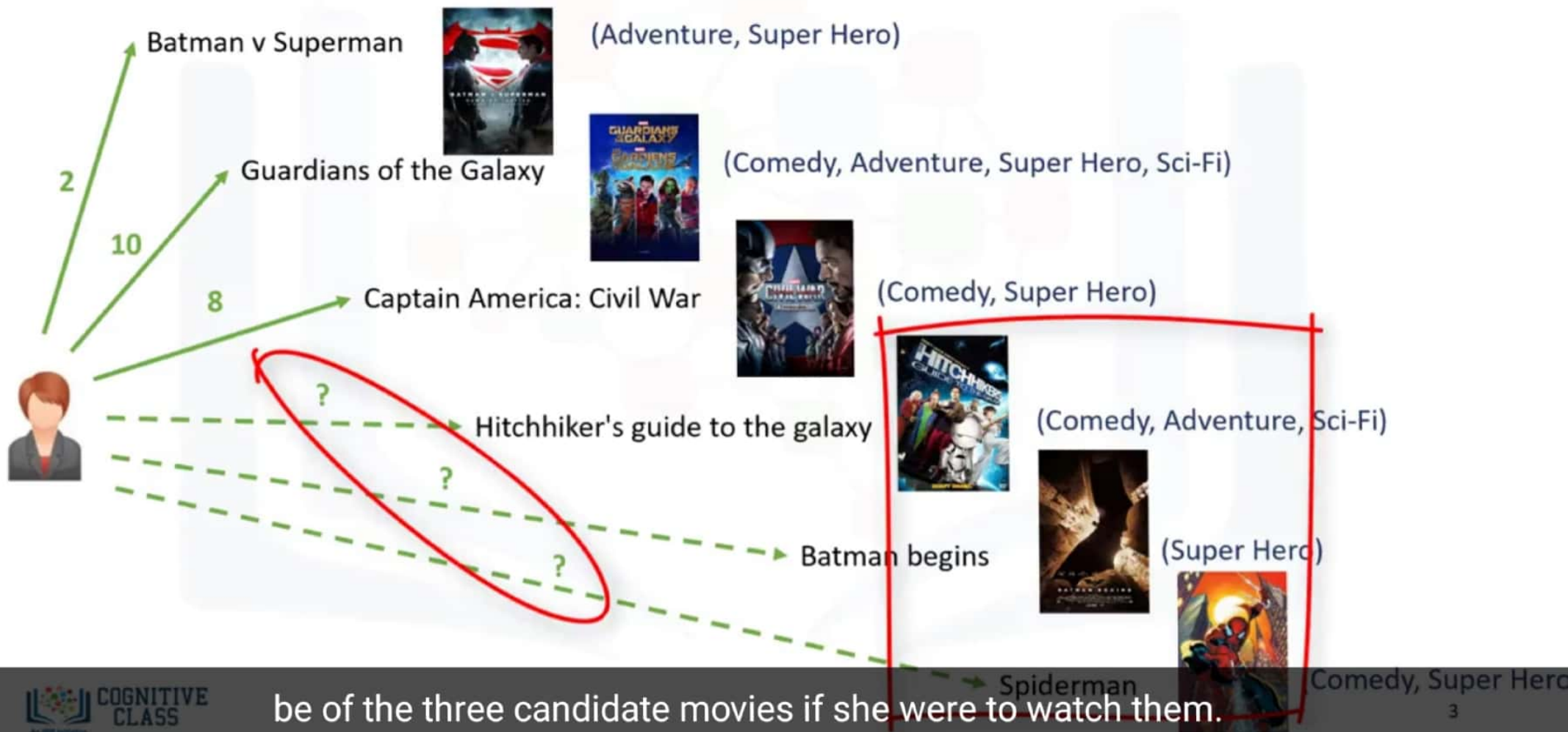
Content-Based Recommender Systems

Saeed Aghabozorgi

Content-based recommender systems



Content-based recommender systems



be of the three candidate movies if she were to watch them.

Weighing the genres

	
	2
	10
	8

Input User Ratings

X

	Comedy	Adventure	Super Hero	Sci-Fi
	0	1	1	0
	1	1	1	1
	1	0	1	0

Movies Matrix

=

Weighted Genre Matrix

	Comedy	Adventure	Super Hero	Sci-Fi
	0	2	2	0
	10	10	10	10
	8	0	8	0

	Comedy	Adventure	Super Hero	Sci-Fi
				

Weighing the genres

	
	2
	10
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Input User Ratings

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	Comedy	Adventure	Super Hero	Sci-Fi
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Movies Matrix


=

	Weighted Genre Matrix			
	Comedy	Adventure	Super Hero	Sci-Fi
	0	2	2	0
	10	10	10	10
	8	0	8	0
	Comedy	Adventure	Super Hero	Sci-Fi
	0.3	0.2	0.33	0.16

User Profile

It clearly indicates that she likes superhero movies more than other genres.

Finding the recommendation

	Comedy	Adventure	Super Hero	Sci-Fi
	0.3	0.2	0.33	0.16




User Profile



	Comedy	Adventure	Super Hero	Sci-Fi
	1	1	0	1
	0	0	1	0
	1	0	1	0

Movies Matrix

=

	Comedy	Adventure	Super Hero	Sci-Fi
	0.3	0.2	0	0.16
	0	0	0.33	0
	0.3	0	0.33	0

Weighted Movies Matrix



Weighted Average
0.66
0.33
0.63

Recommendation Matrix

Content-based recommender systems



Content-based recommender systems



Collaborative filtering

- **User-based collaborative filtering**

- Based on users' neighborhood

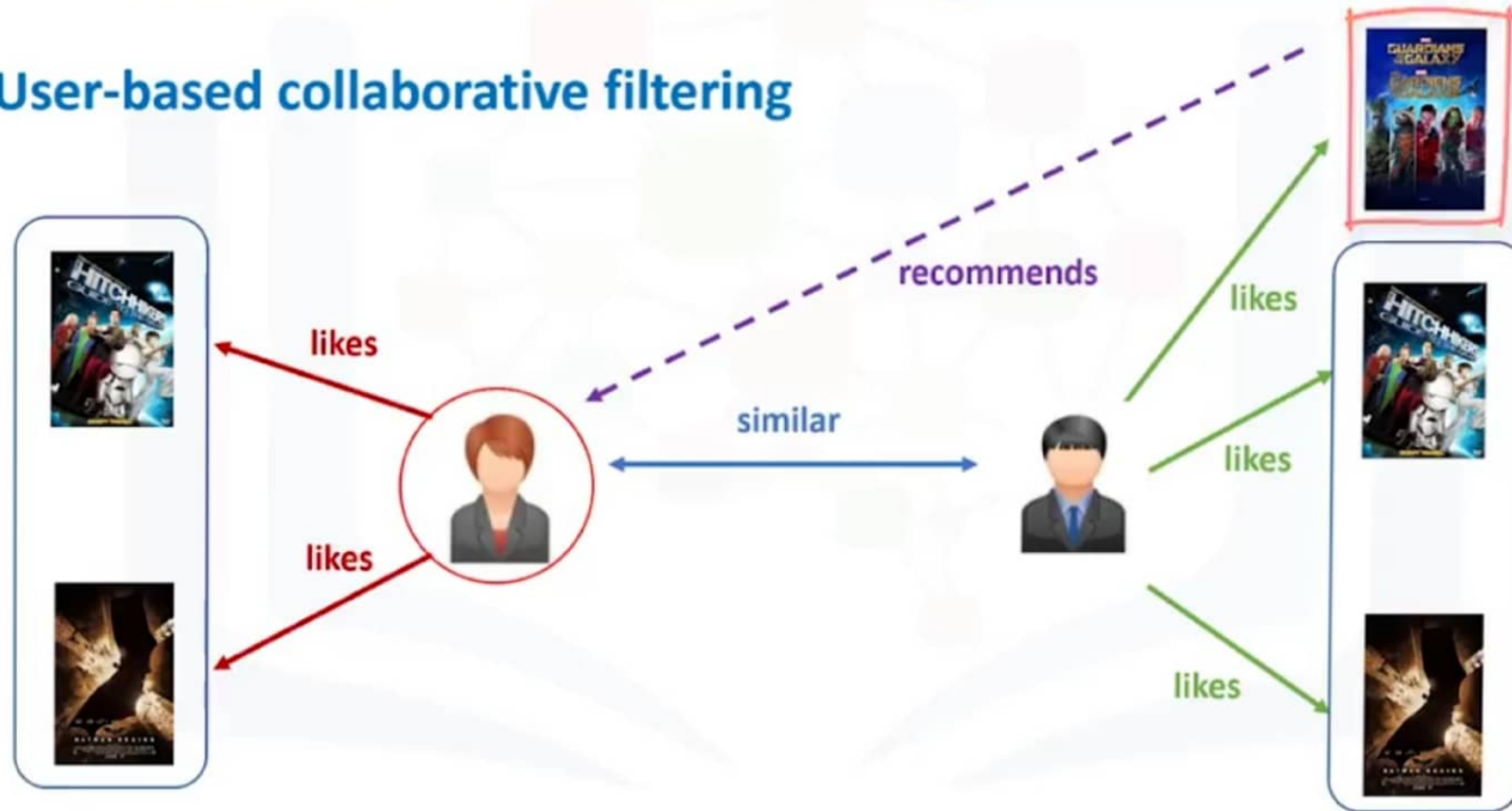
- ★ • **Item-based collaborative filtering**

- Based on items' similarity



Collaborative filtering

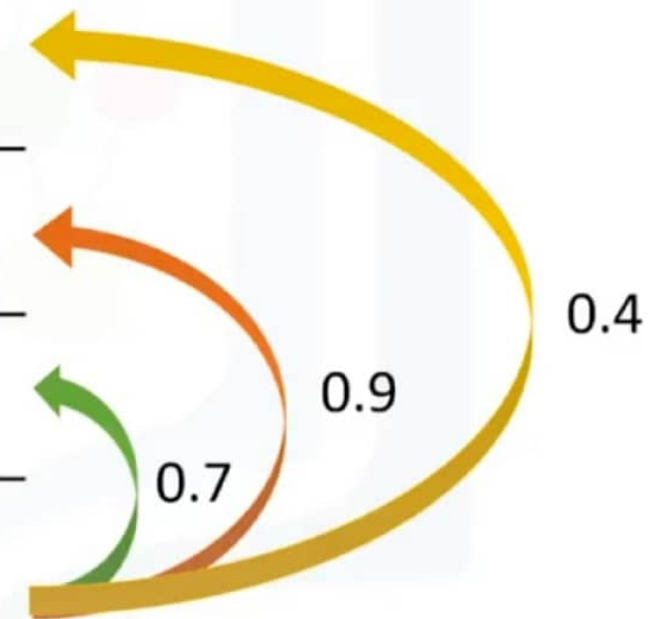
- User-based collaborative filtering



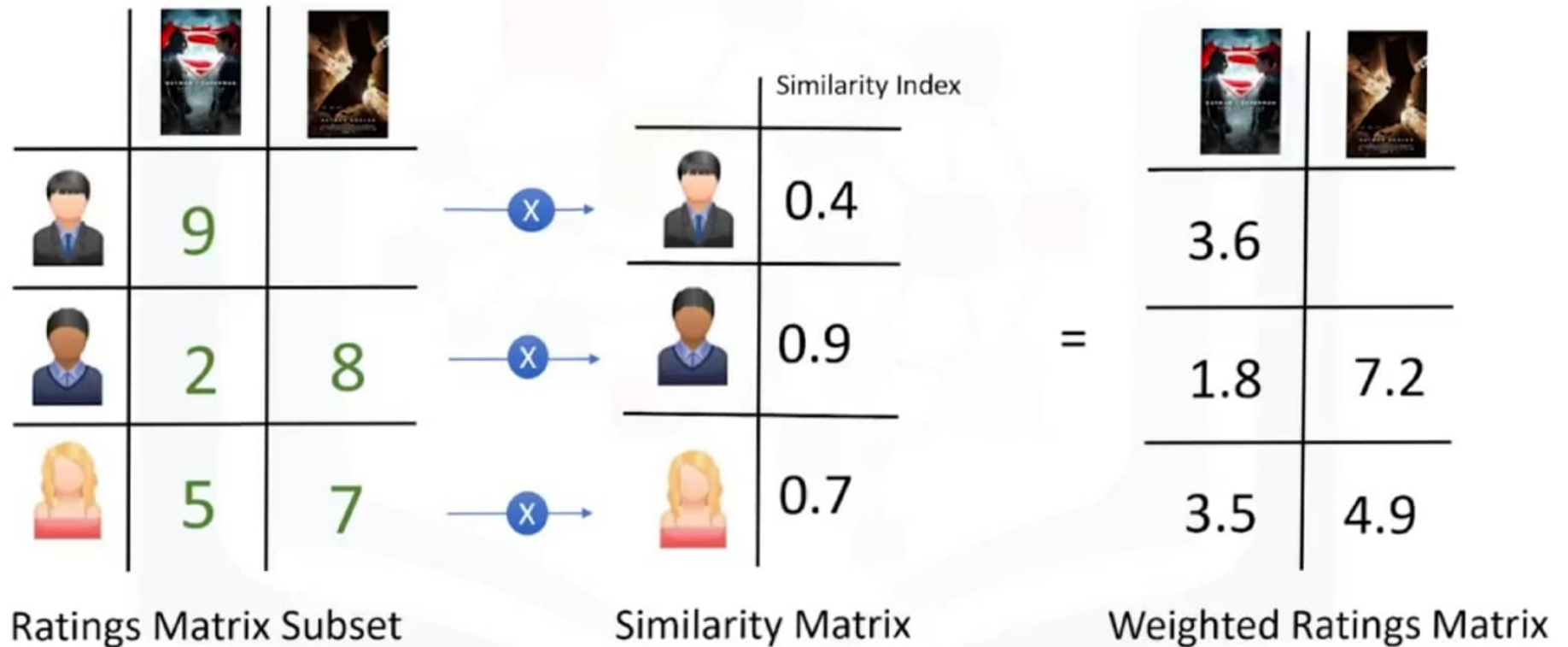
Learning the similarity weights




					
	9	6	8	4	
	2	10	6		8
	5	9		10	7
	?	10	7	8	?

Ratings Matrix





Creating the weighted ratings matrix



	Similarity Index
	0.4
	0.9
	0.7

Similarity Matrix




sum_similarityIndex
 Σ

			Weight Sum
 		12.1	(0.9+0.7)
  	8.9		(0.4+0.9+0.7)

\div

		
	4.4	7.5

Recommendation Matrix

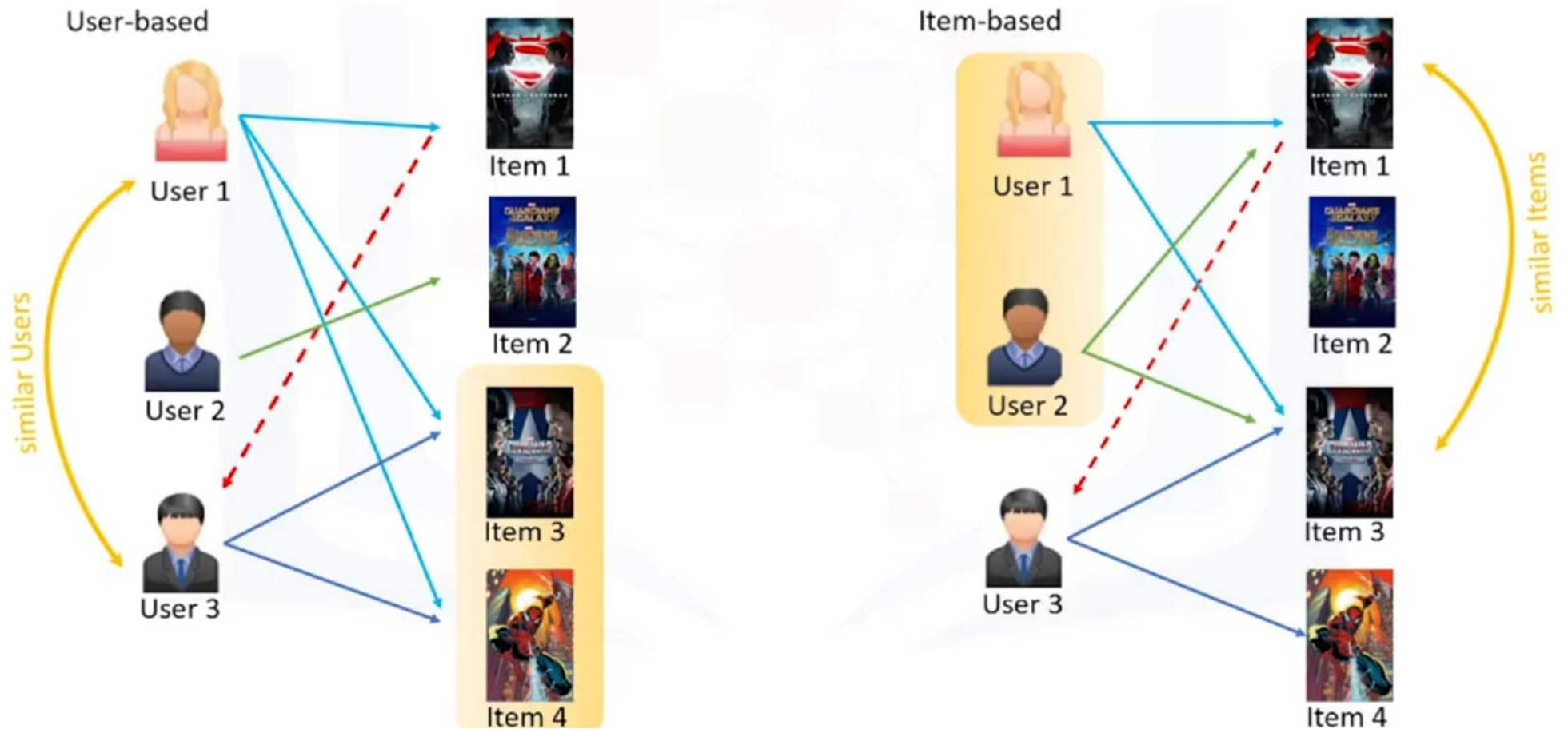
		
	3.6	
	1.8	7.2
	3.5	4.9

Weighted Ratings Matrix

Rating and Weight Matrix

sum_weightedRating
 Σ

Collaborative filtering



Challenges of collaborative filtering

- **Data Sparsity**

- Users in general rate only a limited number of items

- **Cold start**

- Difficulty in recommendation to new users or new items

- **Scalability**

- Increase in number of users or items